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# Assessment of generation adequacy taking into account the dependence of the European power system on natural gas

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*Offen im Denken*

## Motivation

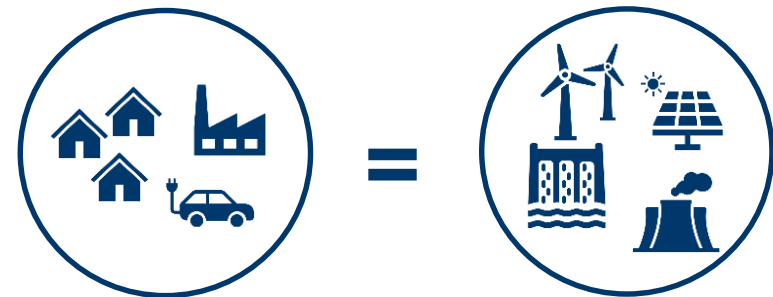
- Quantification of power system uncertainties
- Probabilistic assessment of generation adequacy considering temporal and spatial dependencies
- Assessment of consequences of restricted Russian gas supplies and reduced French nuclear generation capacities for generation ade



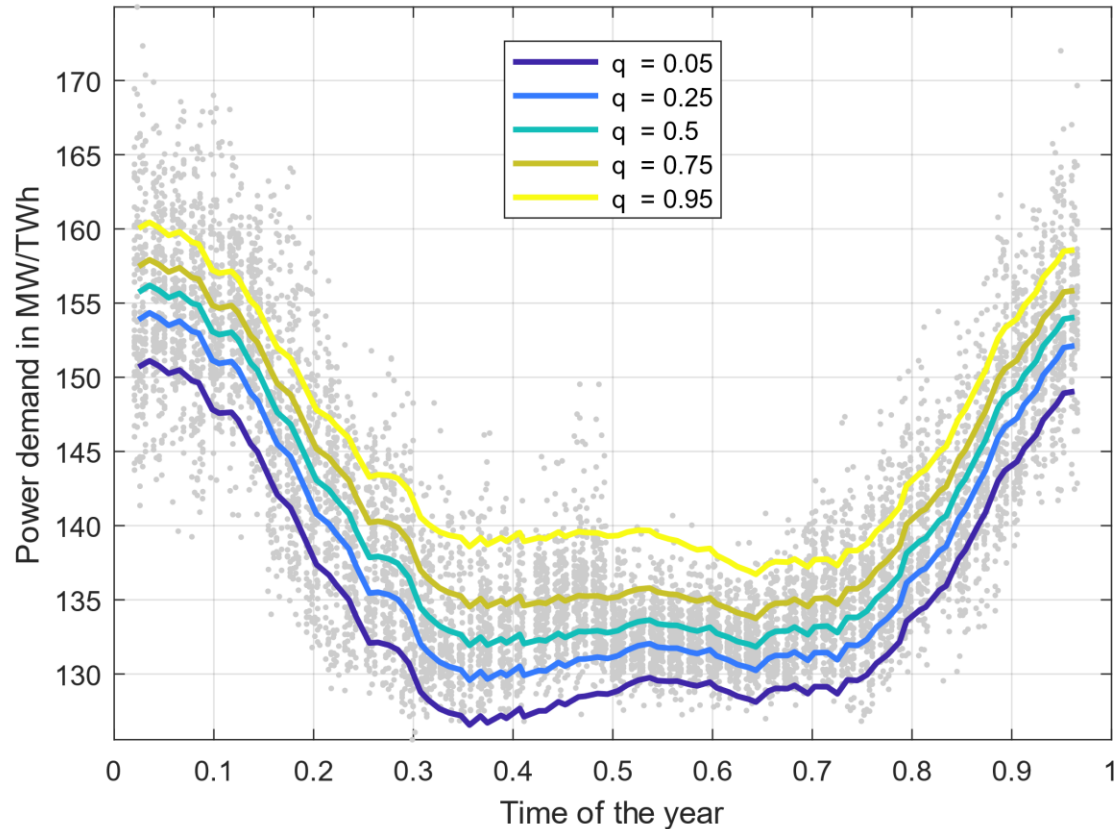
## Research questions

- Is the generation adequacy guaranteed in core European countries with restricted Russian gas imports in winter 2022/2023?
- What effect does the availability of thermal generation capacities have on the generation adequacy in the core European countries?

**Generation adequacy** is the ability of the power system generation to meet the power demand at all points in time (European Commission, 2017).



## Austria: power demand in hour 12



Quantile regressions on functions of  $t$

$$\min \sum_{t \in X_i} d_{q,t}$$

$$d_{q,t} = \begin{cases} q|e_{q,t}| & e_q(t) \geq 0 \\ (1-q)|e_{q,t}| & e_q(t) < 0 \end{cases}$$

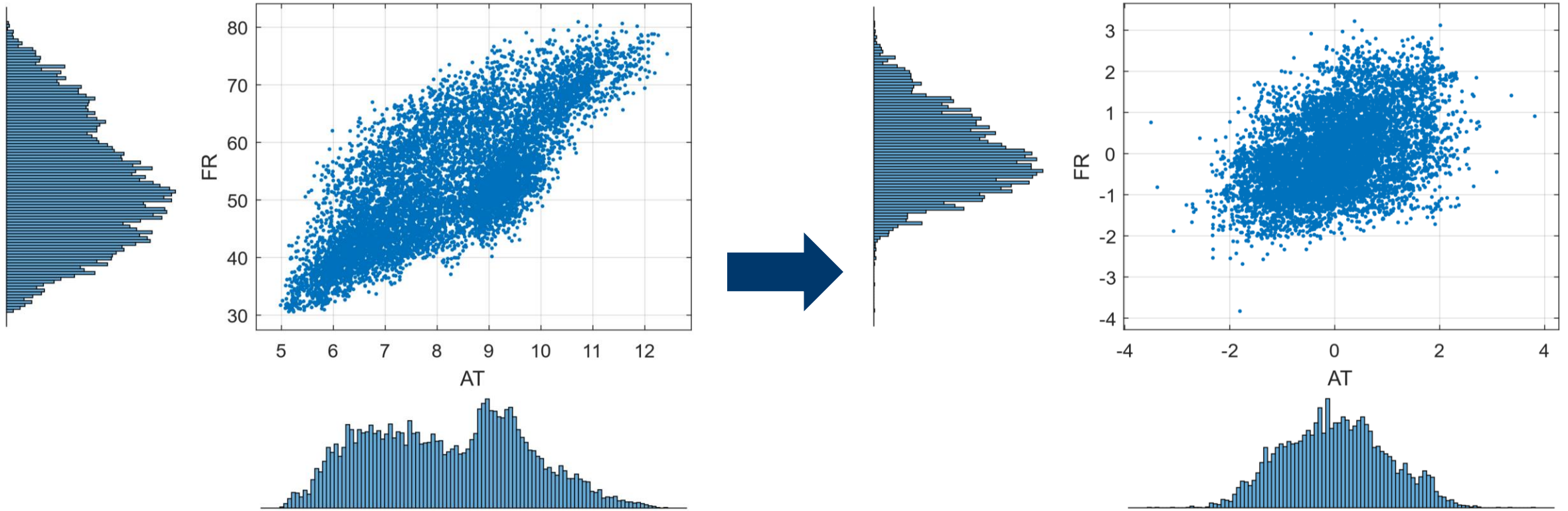
$$e_{q,t} = y_t - f_q(t)$$

$q$ : quantile,  $f_q(t)$ : parametrized function

$$f_{r,h|q}(t) = \alpha_{0,h,r|q} + \alpha_{1,c,r|q} \cdot \cos(2\pi \cdot t) + \alpha_{2,r,h|q} \cdot \sin(2\pi \cdot t) + \alpha_{3,r,h|q} \cdot \cos(4\pi \cdot t) + \alpha_{4,r,h|q} \cdot \sin(4\pi \cdot t)$$

- Estimation of **marginal distribution** as a function of exogenous factors
- **Quantile regression** describes uncertainties by parametric estimations of each quantile with respect to time of the year  $t$ , hour of the day  $h$  and region  $r$ )

## Marginals and correlation of power demand in Austria and France

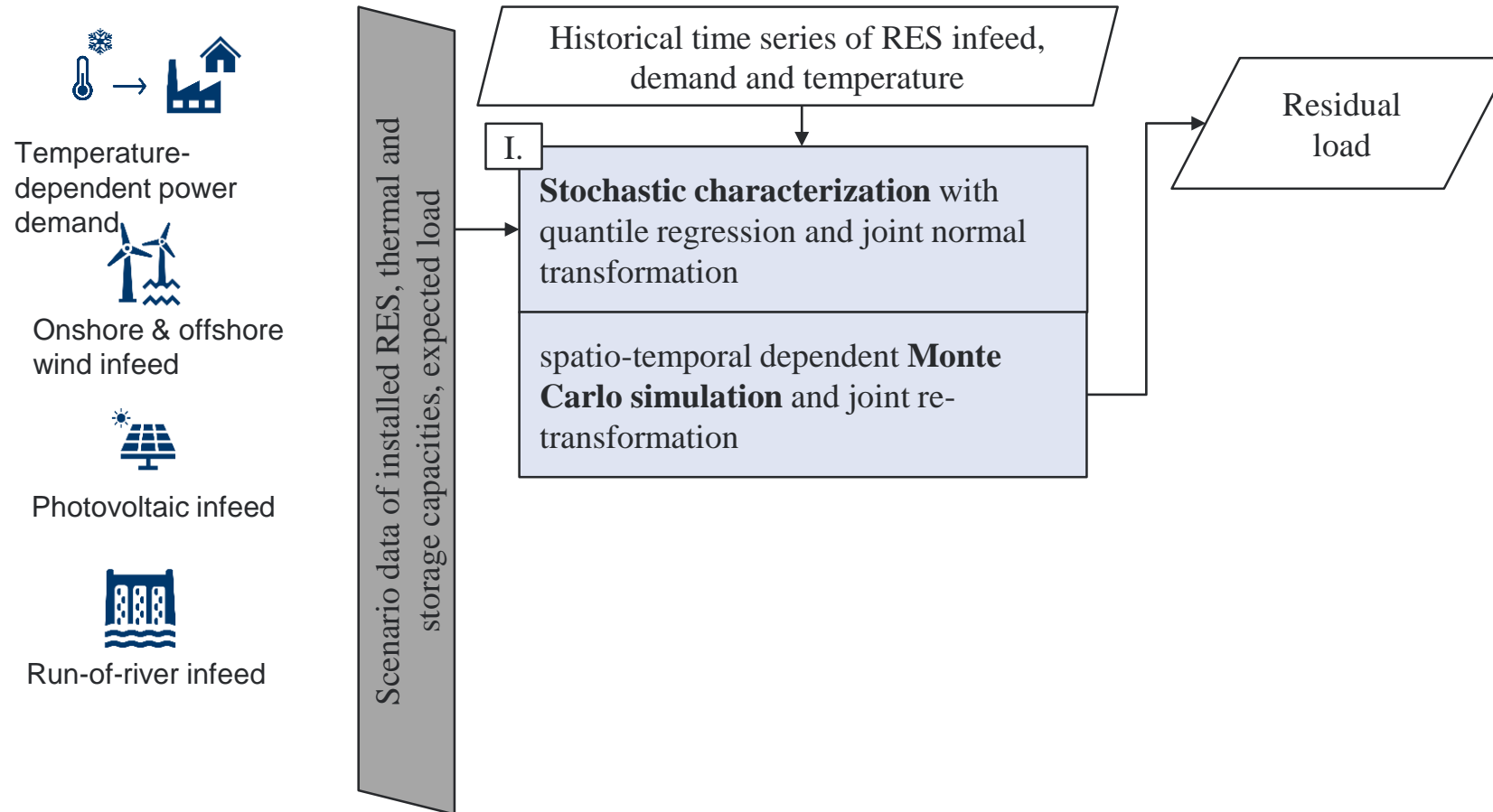


Empirical marginal distributions

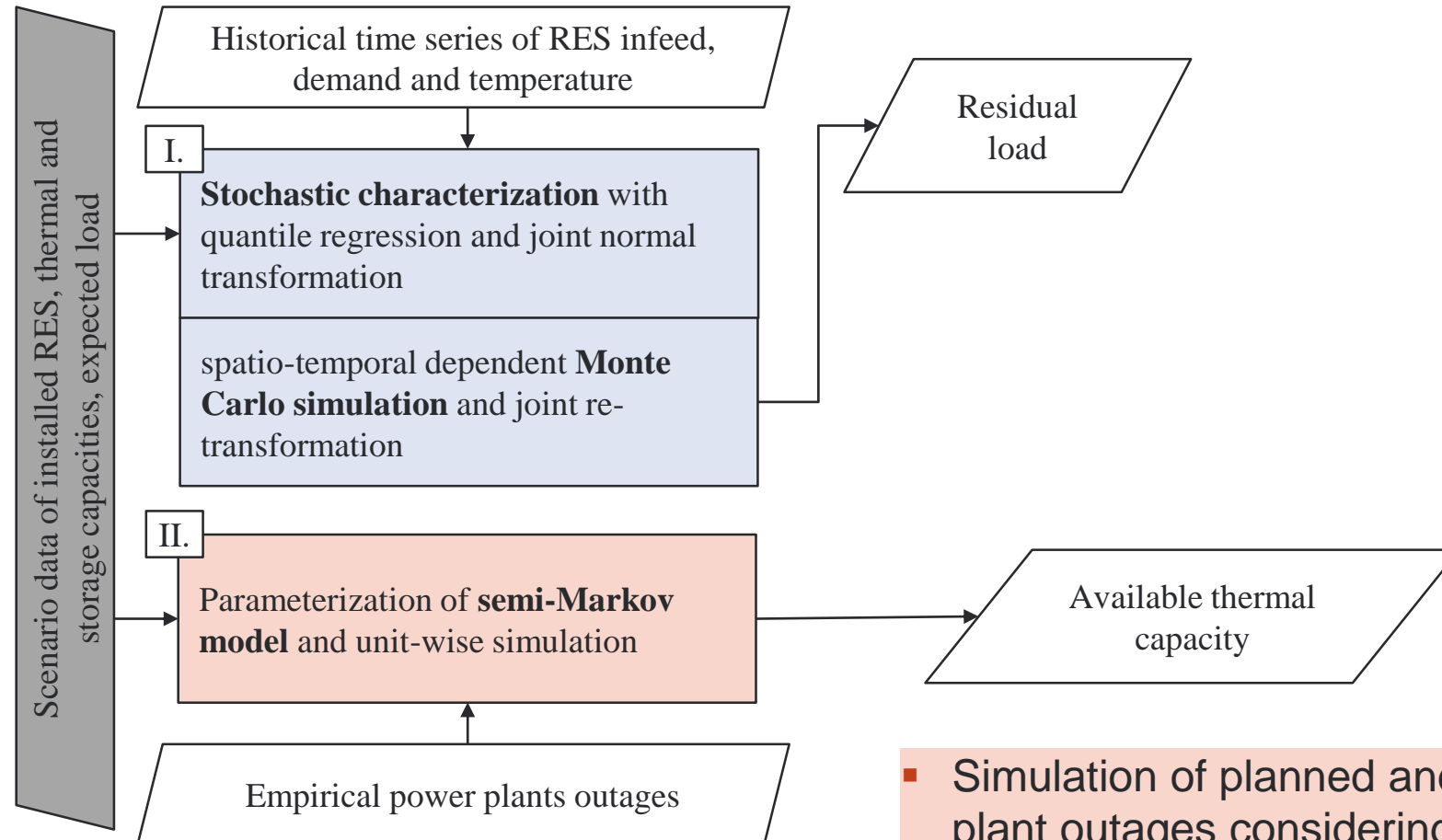
Normal marginal distributions

1. Separation of marginal distributions and their joint dependence structure
2. Parameterization of vector autoregressive model for simulation of spatial and temporal dependent uncertainty factors

# Generation adequacy assessment: General approach

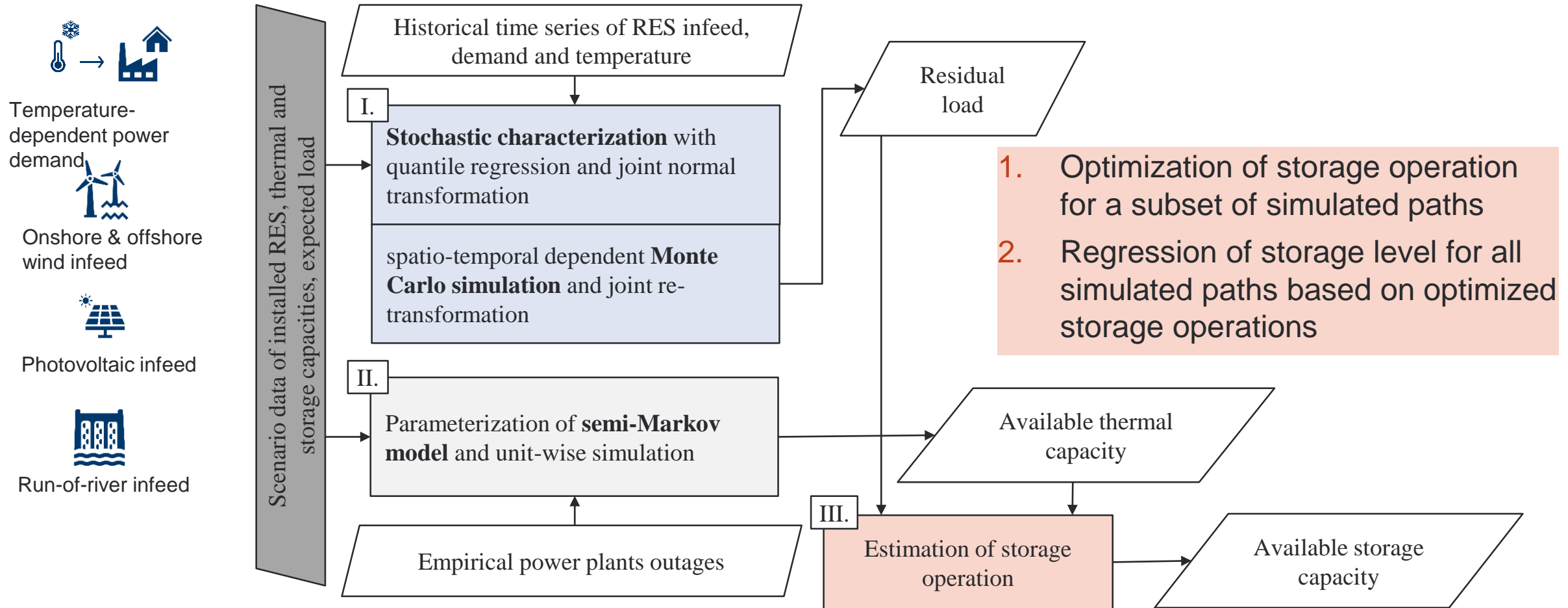


# Generation adequacy assessment: General approach

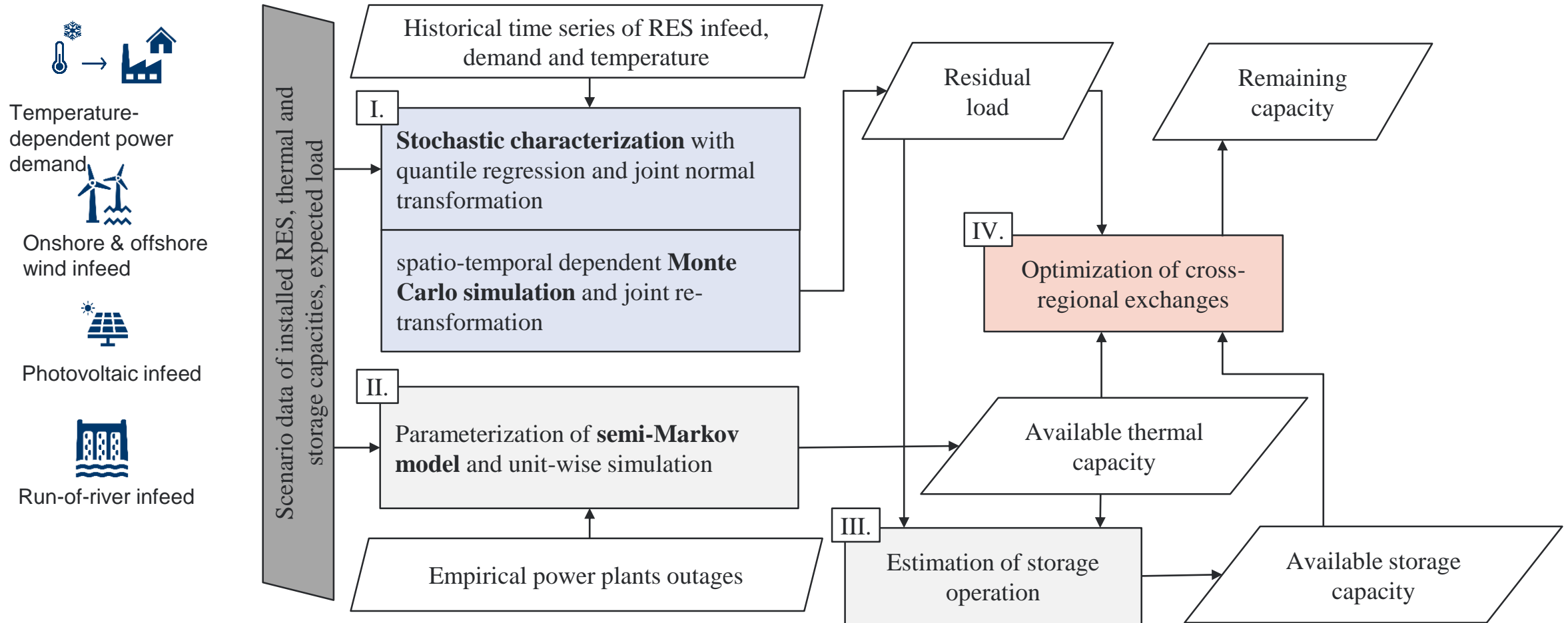


- Simulation of planned and forced power plant outages considering seasonal effects and power plant characteristics
- Consideration of CHP restrictions

# Generation adequacy assessment: General approach



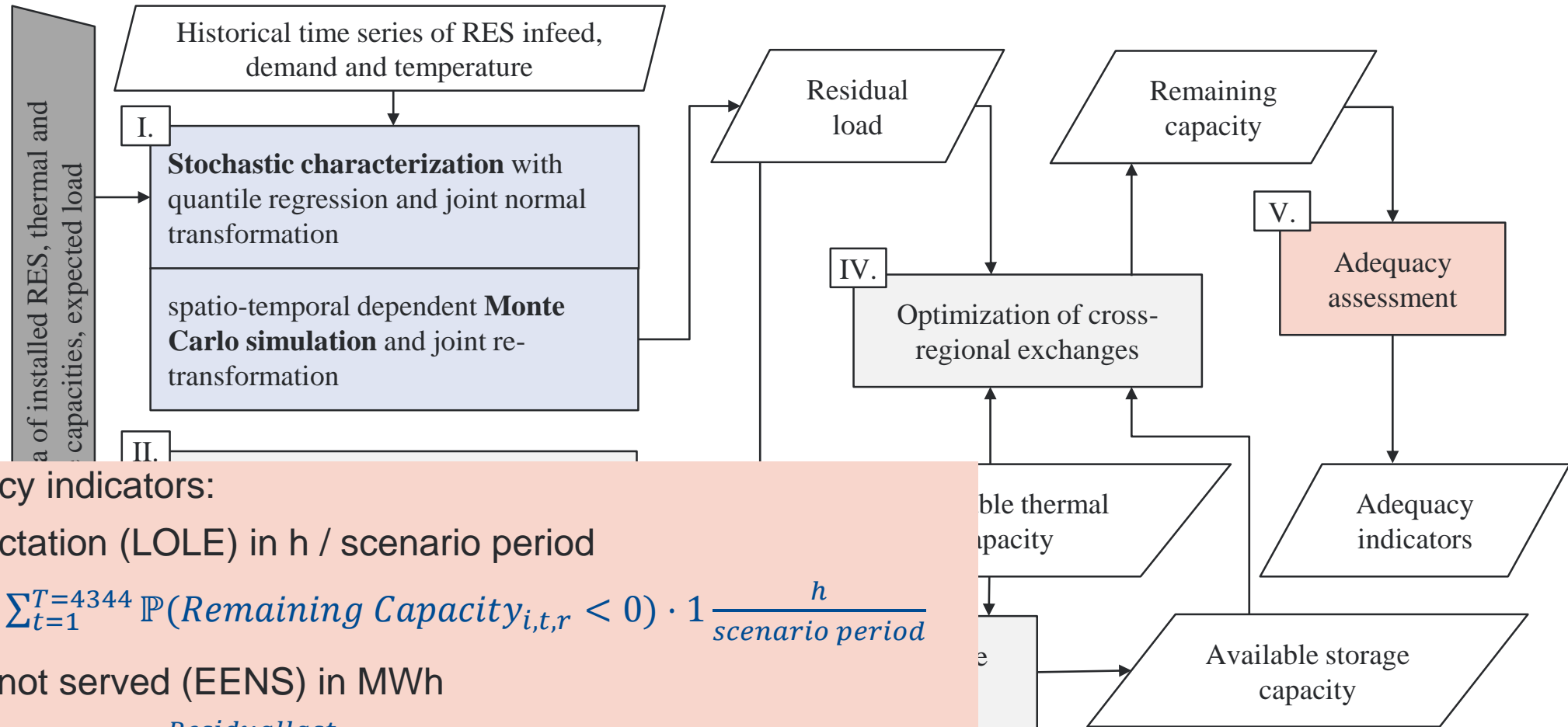
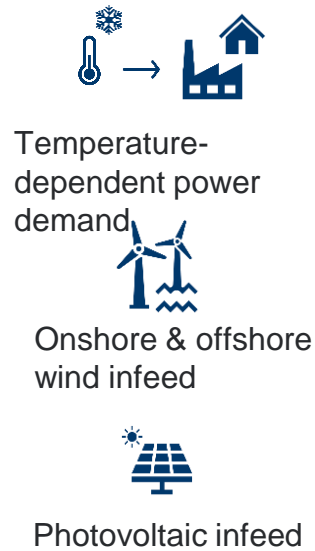
# Generation adequacy assessment: General approach



- For all simulated paths with negative remaining capacity in any region: Optimization of cross-regional exchanges via net-transfer capacities



# Generation adequacy assessment: General approach



## Probabilistic adequacy indicators:

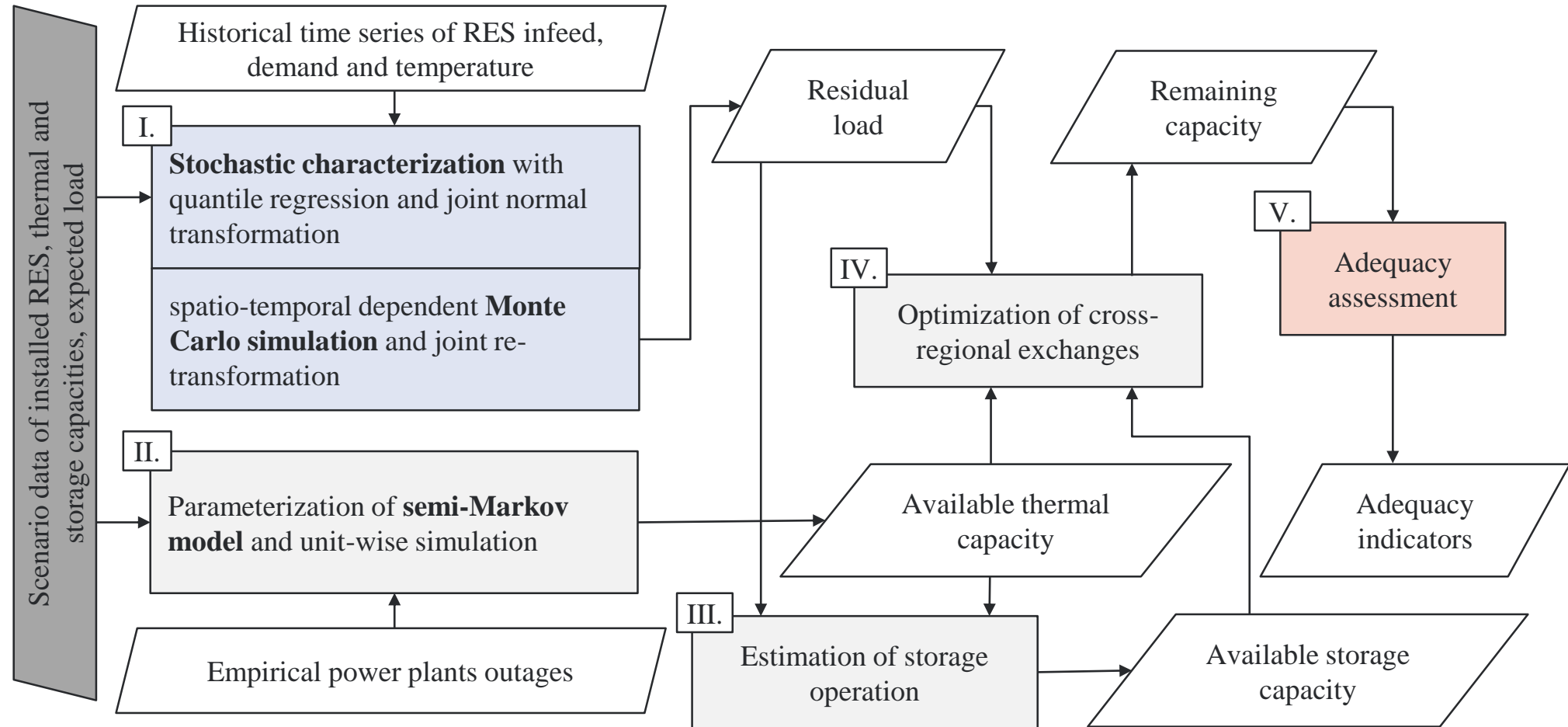
- Loss of load expectation (LOLE) in h / scenario period

$$- LOLE_r = \frac{1}{N} \sum_{i=1}^N \sum_{t=1}^{T=4344} \mathbb{P}(\text{Remaining Capacity}_{i,t,r} < 0) \cdot 1 \frac{h}{\text{scenario period}}$$

- Expected energy not served (EENS) in MWh

$$- EENS_r = \frac{1}{N} \sum_{i=1}^N \sum_{t=1}^{T=4344} \int_0^{\text{Residual}_{i,t,r}} \text{Remaining Capacity}_{i,t,r}$$

# Generation adequacy assessment: General approach



# Case study: Scope & Scenarios

- Scenario period: 01.10.2022 – 31.03.2023
- Scenarios with 1000 simulations each
  - **Reference (S1):** Installed generation capacities, power demand and net transfer capacities based on 2022 according to ENTSO-E Transparency Platform
  - **Gas shortage (S2):** Maximum of 70 % gas power plants available in all regions
  - **Nuclear outage (S3):** French and German nuclear power plants available according to observations / predictions
  - **Heating substitution (S4):** Increased temperature sensitivity and subsequently power demand in Germany
  - **Combined (S5):** S2 & S3 & S4
- Data:
  - Characterization: ENTSO-E Pan-European Climate Database from ERAA 2021
  - Scenario: ENTSO-E Transparency Platform

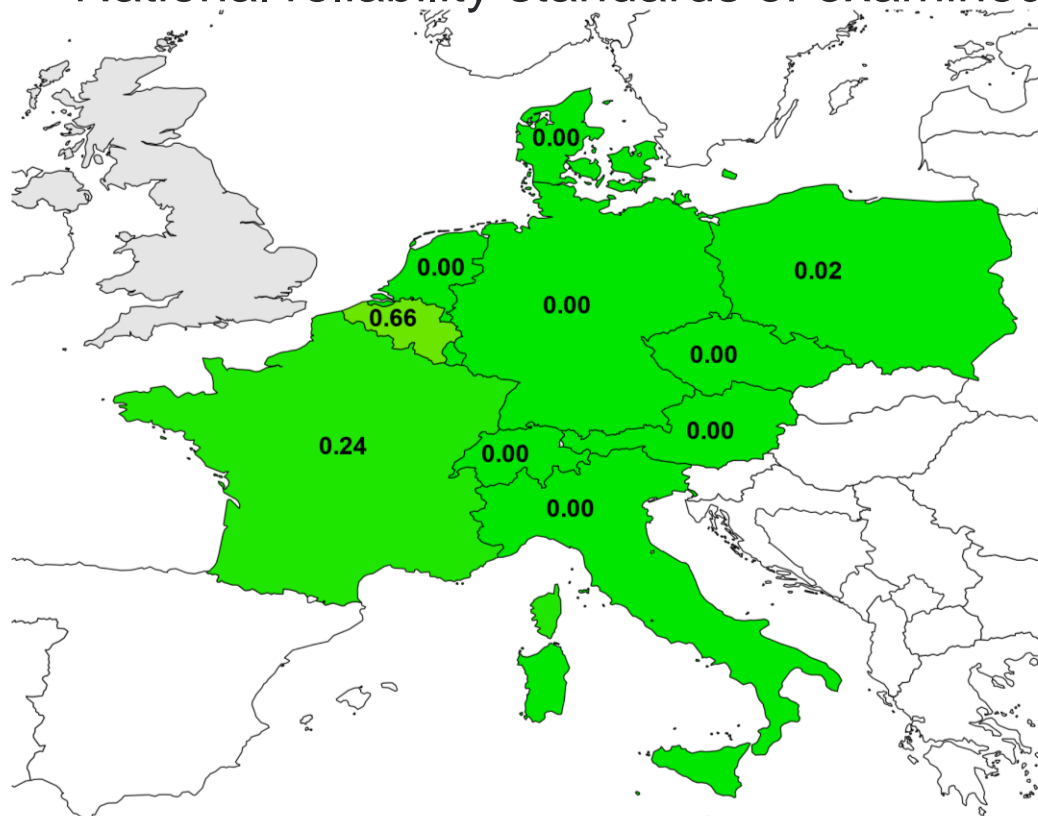


**Geographical scope:** AT, BE, CH, CZ, DE\_LU, DK, FR, IT, NL, PL

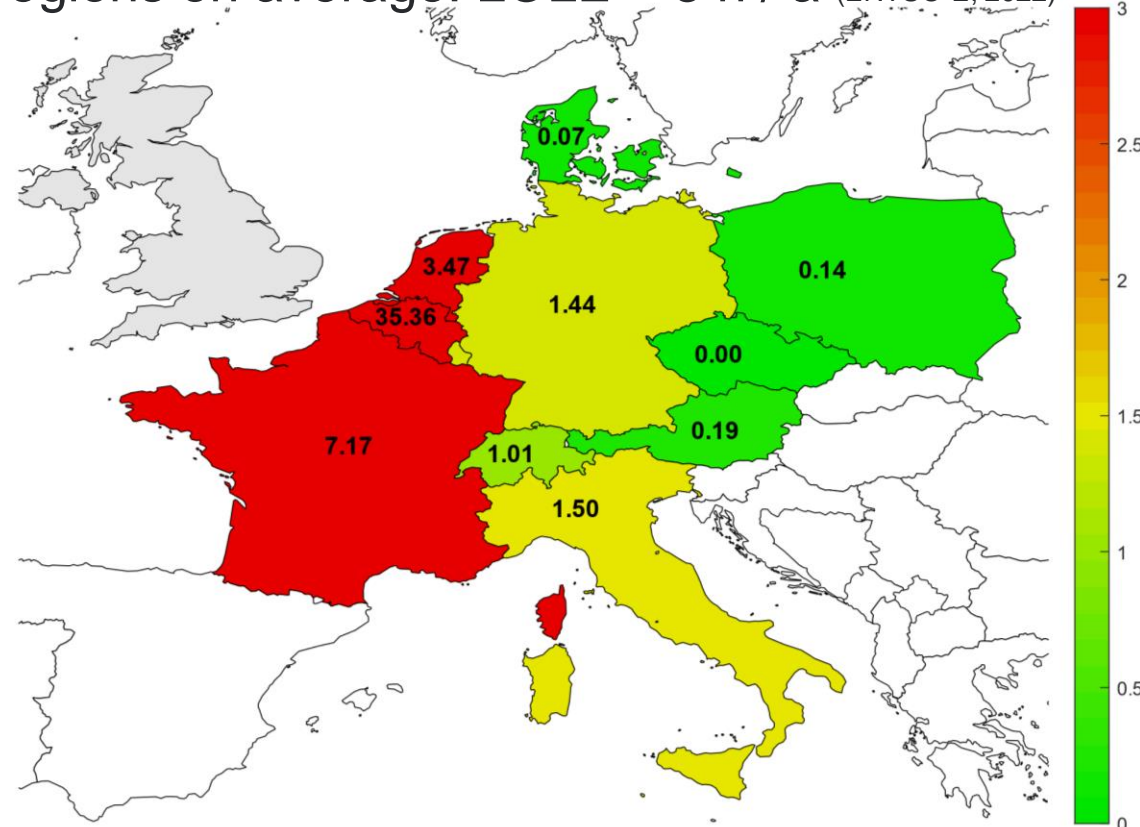
# Case study: Results – Loss of load expectation (LOLE)

## Loss of load expectation (LOLE) in h / scenario period

- National reliability standards of examined regions on average: LOLE = 3 h / a (ENTSO-E, 2022)



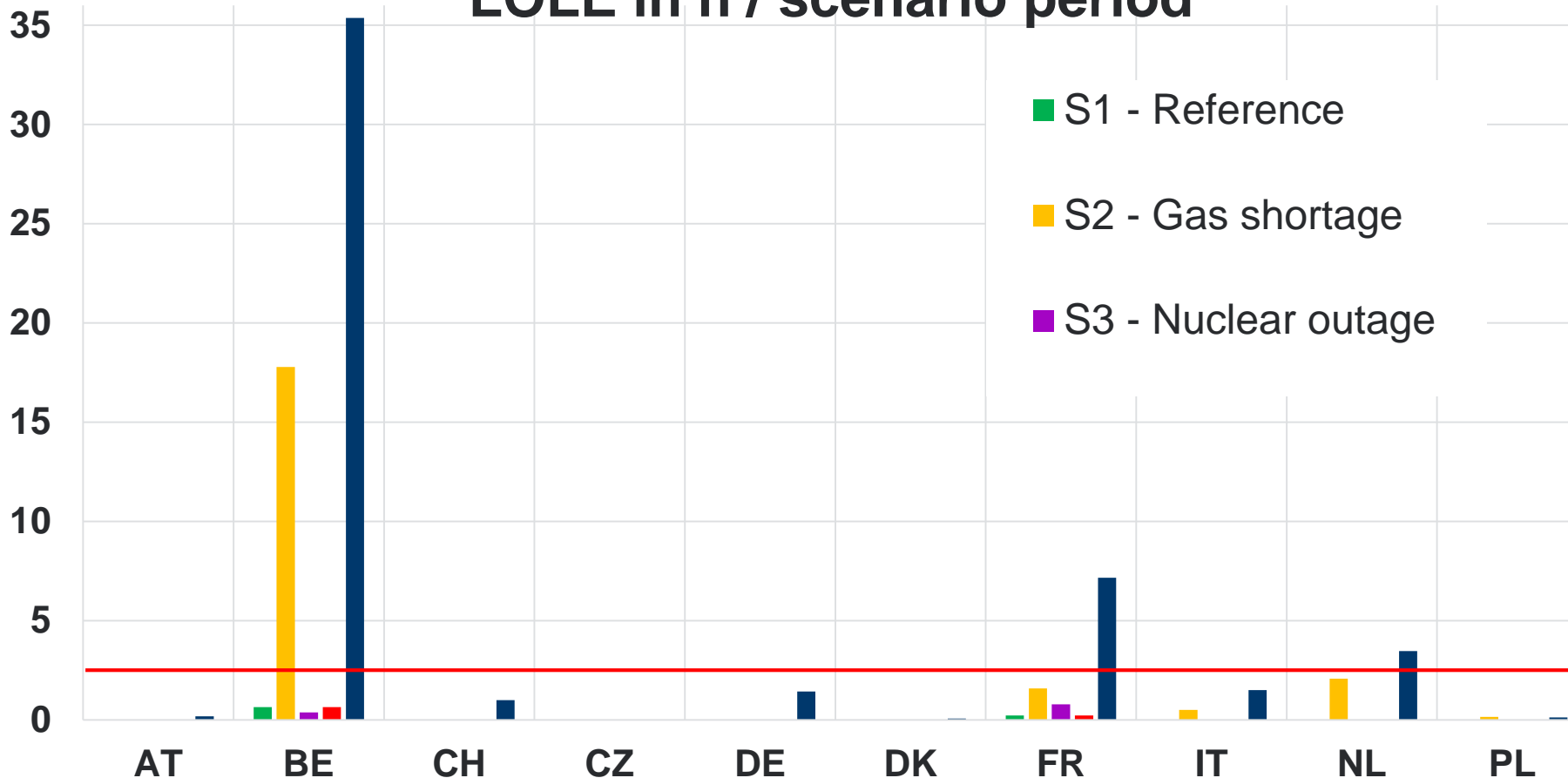
Reference scenario



Combined scenario

# Case study: Results – S1 – S5: Adequacy indicators

## LOLE in h / scenario period



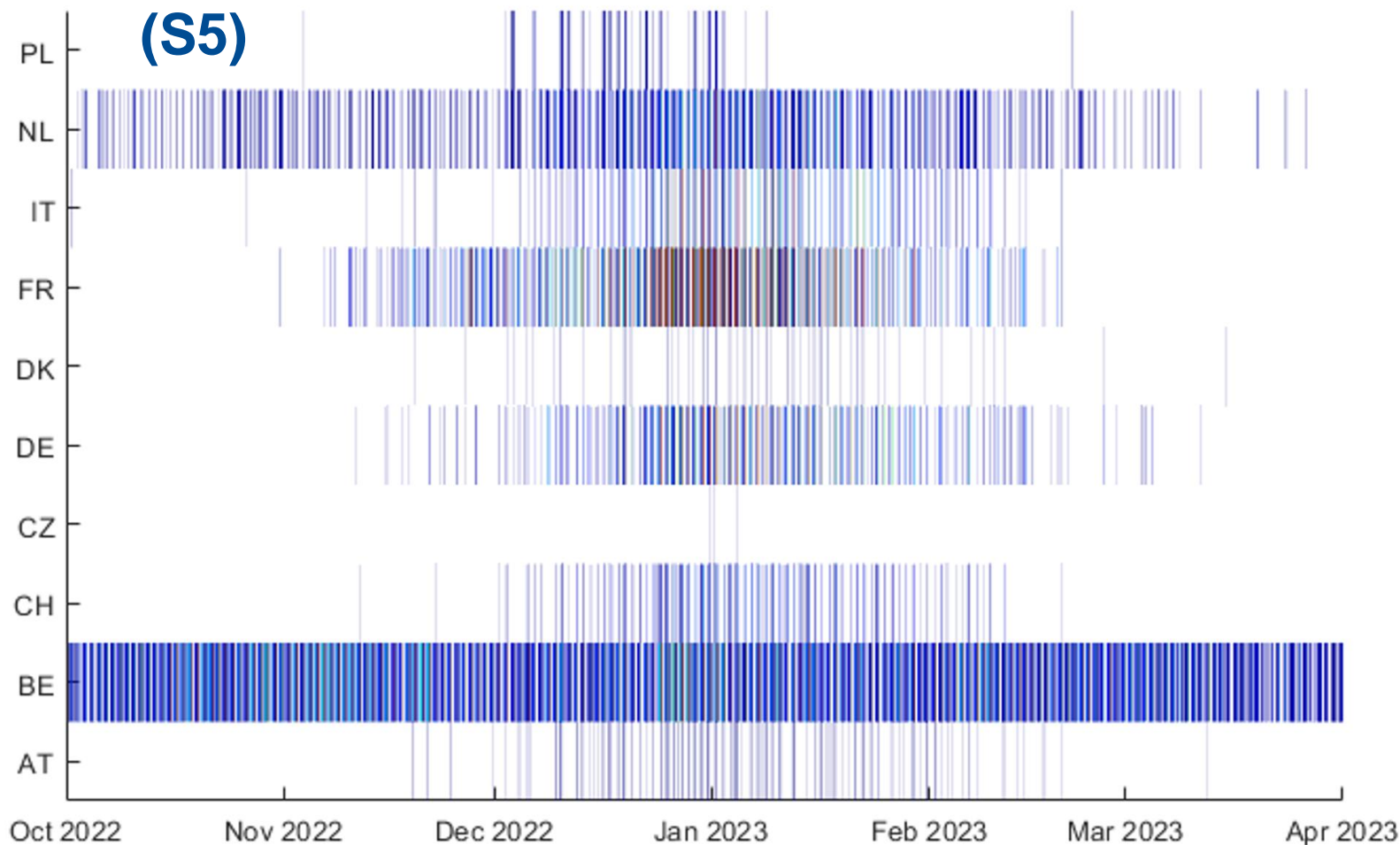
- S2: Highest individual impact in LOLE
- S1 to S4: Compensating effects of hydro storages and cross-regional exchanges mitigate power deficits in most regions and scenarios
- S5: Combined constraints result in highest LOLE in all regions

S5	AT	BE	CH	CZ	DE	DK	FR	IT	NL	PL
	0,00	23.266,52	550,39	0,00	3.535,29	0,38	23.077,36	1.528,09	2.343,84	69,09

Expected energy not served (EENS) in MWh in combined scenario (S5)

# Case study: Results – S5: Temporal distribution

## EENS per hour in MW in combined scenario (S5)



- Average energy not served of 1000 simulations per hour
- BE & NL: Systematic lack of generation capacity
- FR: Several hours of higher EENS

## Probabilistic assessment of generation adequacy in winter 2022/2023 in core European countries

- Monte Carlo simulation considering probability of occurrence of power system uncertainties plus their spatial and temporal dependencies
- Energy storages and cross-regional exchanges significantly improve level of generation adequacy in all examined regions
- Critical levels of generation adequacy in Belgium, France and the Netherlands, if
  - availability of gas-fired power plants restricted to 70 %
  - French nuclear power plants restricted
  - power demand in Germany increased, due to heating substitution effects
- Additional dispatchable generation capacities necessary to ensure generation adequacy
- Modeling of energy storages critical for generation adequacy assessment

# Case study: Results

Scenario	Reference	Gas shortage	Nuclear outage	Heating substitution	Combined
	S1	S2	S3	S4	S5
AT	0,00	0,00	0,00	0,00	0,00
BE	280,82	10.387,22	167,13	281,57	23.266,52
CH	0,00	5,33	0,00	0,00	550,39
CZ	0,00	0,00	0,00	0,00	0,00
DE	0,00	0,00	0,00	0,68	3.535,29
DK	0,00	0,00	0,00	0,00	0,38
FR	462,07	4.047,20	1.649,98	466,76	23.077,36
IT	0,00	423,05	0,00	0,00	1.528,09
NL	0,00	1.145,23	0,00	0,00	2.343,84
PL	5,34	78,82	5,82	5,34	69,09

- Expected energy not served (EENS) in MWh per scenario

Scenario	Reference	Gas shortage	Nuclear outage	Heating substitution	Combined
	S1	S2	S3	S4	S5
AT	0,00	0,00	0,00	0,00	0,19
BE	0,66	17,78	0,39	0,66	35,36
CH	0,00	0,01	0,00	0,00	1,01
CZ	0,00	0,00	0,00	0,00	0,00
DE	0,00	0,00	0,00	0,00	1,44
DK	0,00	0,00	0,00	0,00	0,07
FR	0,24	1,59	0,80	0,24	7,17
IT	0,00	0,51	0,00	0,00	1,50
NL	0,00	2,08	0,00	0,00	3,47
PL	0,02	0,16	0,01	0,02	0,14

- Loss of load expectation in h per scenario



- Data in reference scenario (S1) based on ENTSO-E Transparency Platform

Installed capacity in GW	AT	BE	CH	CZ	DE	DK	FR	IT	NL	PL
Thermal	6,1	13,5	3,6	14,3	88,6	8,0	80,4	54,6	23,6	33,3
Storages	7,7	1,2	12,2	1,8	10,7	0,0	14,7	11,7	0,0	1,7
Renewables	11,8	9,8	4,0	2,7	123,4	8,5	42,1	26,3	27,2	14,2
<b>Total</b>	<b>25,6</b>	<b>24,5</b>	<b>19,7</b>	<b>18,9</b>	<b>222,7</b>	<b>16,4</b>	<b>137,2</b>	<b>92,6</b>	<b>50,8</b>	<b>49,2</b>

	AT	BE	CH	CZ	DE	DK	FR	IT	NL	PL
Power demand in TWh	33,2	43,9	34,1	35,5	261,7	18,7	261,4	142,9	57,2	89,3